

# The FHWA Travel Model Improvement Program Workshop over the Web

The Travel Model  
Development Series:  
Part I –  
Travel Model Estimation

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1

## Webinar Outline

- Session 1: Introduction – October 16, 2008
- **Session 2: Data Set Preparation – November 6, 2008**
- Session 3: Estimation of Non-Logit Models – December 11, 2008
- Session 4: Estimation of Logit Models – February 10, 2009

2

## Webinar Outline (continued)

- Session 5: Application and Validation of Logit Models – March 12, 2009
- Session 6: Advanced Topics in Discrete Choice Models – April 14, 2009
- Session 7: Trip Assignment – May 7, 2009
- Session 8: Evaluation of Validation Results – June 9, 2009

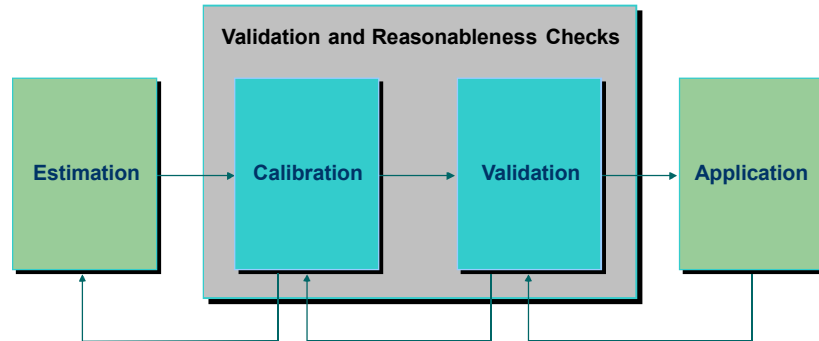
3

## Homework

From Session 1

4

## The Role of Data in Travel Modeling



## The Role of Data in Travel Modeling

- Estimation
  - Local data for parameter estimation
- Validation/calibration
  - Observed data for comparisons and checks
- Application
  - Network, socioeconomic, and other data

## The Importance of Data Quality

- Potential data quality problems
  - Errors in data collection, computation, transcription, etc.
  - Incorrect data processing
  - Out of date information
  - Statistical insignificance

7

## The Importance of Data Quality

- Effects
  - Incorrectly estimated model parameters
  - Incorrect input data (garbage in...)
  - Model application inconsistent with context
  - False precision of results

8

## Data for Model Estimation

- Local survey data
- National data (Census, NHTS)
- Network data/skims
- Socioeconomic data
- Other (parking costs, auto operating costs)

9

## Data for Model Application

- Network data/skims
- Socioeconomic data
- Other (parking costs, auto operating costs)

10

## Data for Model Validation

- Local survey data
- National data (Census, NHTS, NCHRP 365)
- Observed travel information
  - Traffic counts
  - Transit ridership/boardings
  - Highway speeds

11

## Model Estimation Data Sources

- Household activity/travel survey (household, trip level)
- Transit on-board survey
- Other surveys
- Critical nonsurvey data
  - Socioeconomic data
  - Networks
  - Other (area types, parking costs, auto operating costs, etc.)

12

## Model Types

Household level	<ul style="list-style-type: none"><li>• Auto ownership</li><li>• Trip production</li></ul>
Trip level	<ul style="list-style-type: none"><li>• Mode choice</li><li>• Trip distribution (logit)</li></ul>
Aggregate	<ul style="list-style-type: none"><li>• Trip attraction</li><li>• Trip distribution (gravity)</li><li>• Time of day</li></ul>

13

## Person Data File From Household Survey

- Each record represents a person
- Each field represents a characteristic of the person (age, gender, worker status, student status, etc.)
- Not used directly in most four-step models (household based)
- Often used in person based models such as activity based
  - Would include characteristics of the household for model estimation

14

## Household Data File From Household Survey

- Each record represents a household
- Each field represents a characteristic of the household or its location

15

## Household Data File Typical Fields

### From the survey

- Location (zone/point)
- Number of persons
- Number of workers
- Number of children
- Number of autos
- Income level
- Number of trips by purpose

### From other sources

- Area type of zone
- Residential and commercial density
- Accessibility measures (for auto availability)

16



## Household Data File Data Checks

- **Completeness** (fields, members of household)
- **Consistency checks**
  - Consistency with person file
  - Number of persons  $\geq$  # of workers, # of children, etc.
  - Numbers add up, e.g. persons = males + females
- **Reasonableness checks**
  - Distributions of households by # of persons, # of workers, # of autos, income level, etc.
- **Geocoding errors**
- **Weights**
  - Weights should sum to the population represented for each segment

17

## Household Data File Dealing with Missing/Incorrect Data

- **Missing data**
  - Can they be deduced?
  - Should they be imputed?
  - Income is commonly missing from 10-20% of records (refusals to respond)
  - Add a field or value to indicate missing data
- **Incorrect data**
  - Can they be corrected? Not usually
  - Survey response or coding errors
  - Failed logic/consistency checks

18

## Trip Data File From Household/On-Board Surveys

- Each record represents a trip made by an individual
- Each field represents a characteristic of:
  - The trip;
  - The traveler;
  - His/her household; or
  - The areas traveled

19

## Trip Data File Typical Fields

### From the survey

- Origin and destination
- Trip purpose
- Chosen mode
- Time of day of trip
- *Trip time/cost*
- Household/person characteristics (linked from household/person file)

### From other sources

- Travel time (in-vehicle)
- Other time components (wait, access/egress, transfer)
- Costs (parking, auto operating, transit fare)
- Number of transit transfers
- Zone attributes
- Logsums from other models

20

## Trip Data File

### Why Not Use Reported Level of Service Data?

- Rounding of responses to 5, 15, even 30 minutes
- Perception bias varies among individual respondents
- Need a consistent source of information for all records
- Need information for non-chosen alternatives

21

## Trip Data File

### Attaching Data from Other Sources

- Index data to be attached based on an identifier in the survey data records (e.g. zone number)
- Set up other data sources as lookup table

Zone	Area Type
1	5
2	4
...	...
n	2

22

## Trip Data File Data Checks

- Logic/reasonableness checks
  - Reported mode consistent with travel time
  - Reported times/costs consistent with skims
  - Chosen mode availability
  - Excessive times/costs/transfers
  - Consistency of times of day for each person
  - Origin of trip = destination of last trip
  - Origin and destination must be different for each trip
  - Bus routes used

23

## Combining Household and On-Board Survey Data

- Data not appearing in all surveys
- Differences in question wording
- Differences in data ranges
- Surveys done at different times
- Changes in transportation system

24

## Setting up Data for Disaggregate Model Estimation

1. Assemble survey data
2. Data checks
3. Create necessary variables
  - a. Maximum values
4. Attach skim data
5. Data checks
6. Designate choice variable

25

## Setting up Data for Aggregate Model Estimation Trip Attraction Model - linear regression

- Define independent variables to be tested
- Use trip file – weighted data
- Aggregate to districts
- Attach district level data
  - Employment by type
  - Households

26

## Setting up Data for Aggregate Model Estimation Gravity Model

- Define independent variable (e.g. highway travel time)
- Use trip file – weighted data
- Compute trip length frequency distribution by trip purpose

27

## Setting up Data for Aggregate Model Estimation Time of Day Model

- Determine resolution for testing (e.g. half hours)
- Use trip file – weighted data
- Define time variable (e.g. departure time, arrival time, midpoint)

28

# Homework

## Session 2

29